

Data QA/QC Self-Review & Automation





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Workshop Goals

Who should attend?

- Site teams submit flux/met data regularly
- Site teams have interest in participating in the development and test

Presentation (~50 minutes)

- Data pipeline overview
- QA/QC process and test modules
- Q & A (~10 minutes)
- Plan for this year and next stage

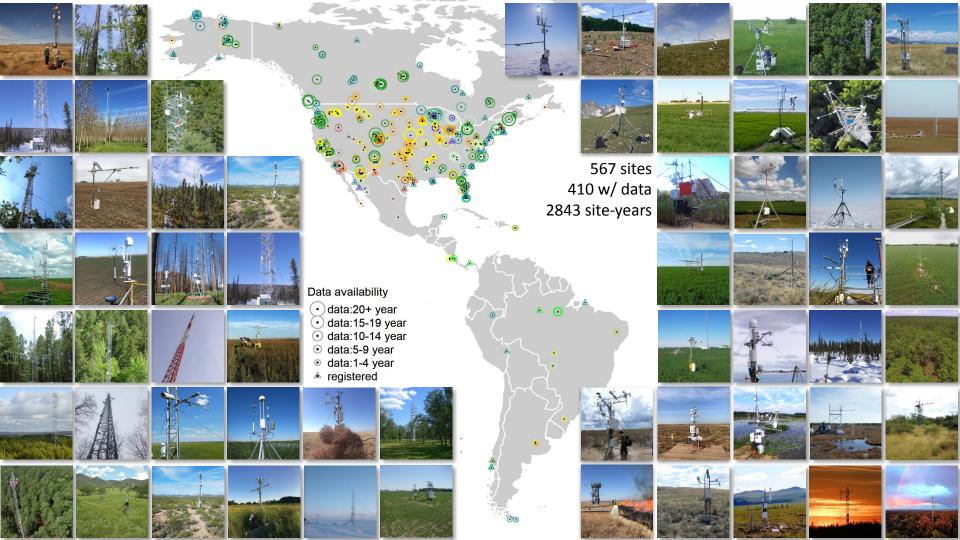
Discussion (~40 minutes)

• https://docs.google.com/document/d/1HuDNhYrXUMGB0YDMNcZjkP1Yr2GjsbHVprpk-HiBjxU/edit?usp=sharing

The presentation will be recorded and made available on AmeriFlux website.

Mute during presentation. Unmute for Q & A.

View chat window. Send messages for questions, comments & zoom help. Technical support in webinar AMP-webinars@lbl.gov













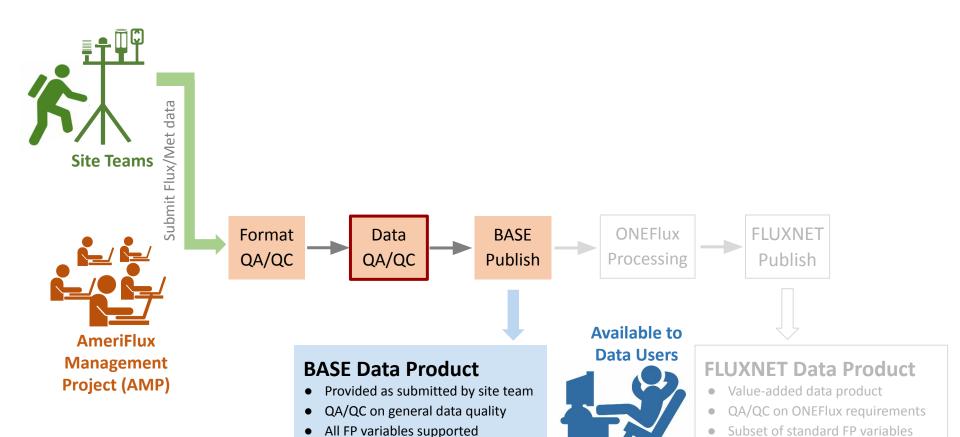
BASE Data Product

- Provided as submitted by site team
- QA/QC on general data quality
- All FP variables supported
- All levels of aggregation supported



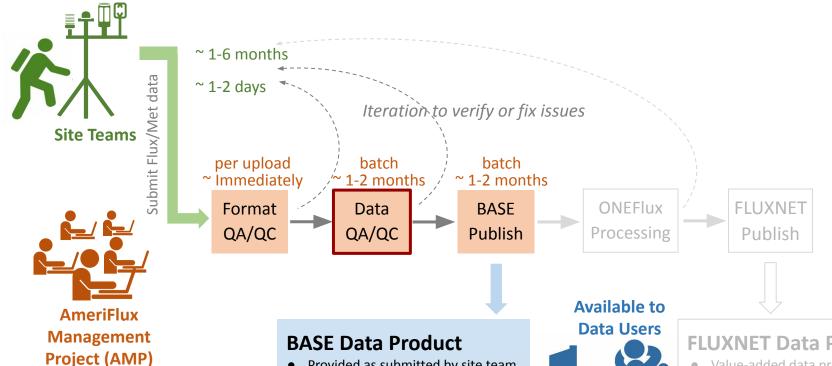
FLUXNET Data Product

- Value-added data product
- QA/QC on ONEFlux requirements
- Subset of standard FP variables
- Site-representative aggregation



Site-representative aggregation

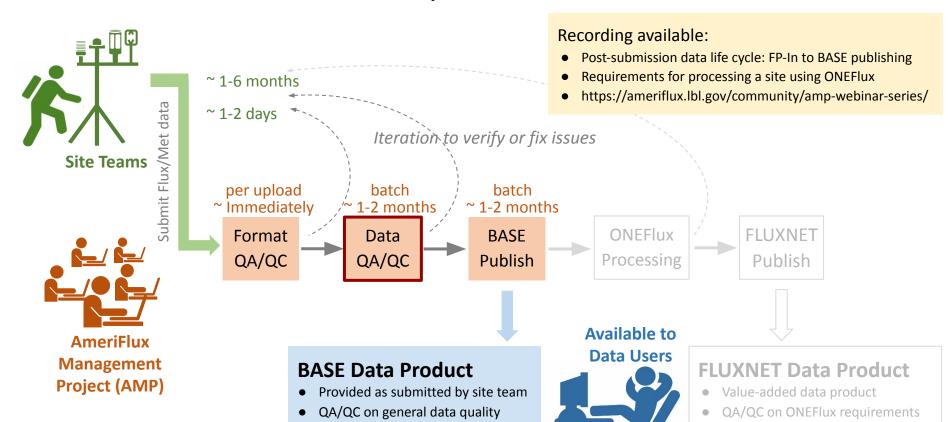
All levels of aggregation supported



- Provided as submitted by site team
- QA/QC on general data quality
- All FP variables supported
- All levels of aggregation supported

FLUXNET Data Product

- Value-added data product
- QA/QC on ONEFlux requirements
- Subset of standard FP variables
- Site-representative aggregation

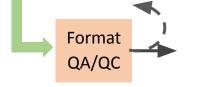


All FP variables supported

All levels of aggregation supported

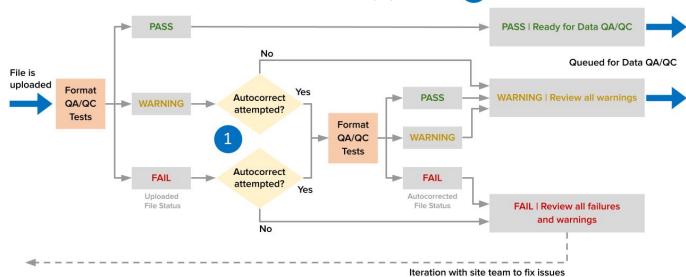
Subset of standard FP variables

Site-representative aggregation



Format QA/QC Processing

- Fully-automated process begins immediately upon upload
- Format QA/QC Report links emailed to uploader ~15 minutes after upload
- Per file evaluation
- One attempt to auto-correct any issues (1)
- File is queued for Data QA/QC if PASS or WARNING result (2)



Overall Status | Site Team Action

Format QA/QC Report Email

AmeriFlux QAQC-3065 Format Results - ACTION REQUIRED CC-sss data uploaded on Sep 04, 2019 D Indox N



Dear Danielle Christianson,

Thank you for uploading data for CC-sss on Sep 04, 2019.

Format QA/QC results

CC-sss HR 200001011000 200001012000_bad29.csv:

- FAIL | Replacement file required.
- Read details in this report: https://ameriflux.lbl.gov/qaqc-report/?site id=CC-sss&report id=63097

CC-sss HR 200001011000 200001012000 scinot.csv:

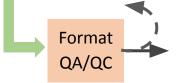
- . FAIL | Replacement file required.
- Read details in this report: https://ameriflux.lbl.gov/gagc-report/?site_id=CC-sss&report_id=63096

Format QA/QC assesses the compliance of your data submission with AmeriFlux FP-In format (https://ameriflux.lbl.gov/half-hourly-data-upload-format/. If needed, you can re-upload your data at https://ameriflux.lbl.gov/data/upload-data/ and/or reply to this email to discuss with us.

View the status of all your uploaded files at https://ameriflux.lbl.gov/gaqc-reports-data-team/.

If all files passed Format QA/QC and there are no pending issues for your site, Data QA/QC will be run. You can track communications on this Format QA/QC report at QAQC-3065 using your AmeriFlux account ID and password to login.

Sincerely, **AMP Data Team**



Format QA/QC Report

QA/QC Report: Format

This report details results of the AmeriFlux QA/QC data processing pipeline. For more information, see How to Read This Report, QA/QC Results Definitions,

Ready for Data QAQC No further action needed by the site team.

Uploaded File Report

US-PFa_HR_201801010000_201901010000.csv

Site ID: US-PFa Site contact: Ankur Desai

Uploader: Ankur Desai Upload date: 2018-Jul-16 11:44

Uploaded filename: US-PFa_HR_201801010000_201901010000-20180

Format QA/QC report summary:

All format QA/QC tests attempted. No issues were encountered. AMP will

Test	Results	Add
All Format OA/OC tests passed	✓ PASS	

Variable names found in the file:

TIMESTAMP_START, TIMESTAMP_END, CO2_1_1_1, CO2_1_2_1, CO2
CH4_1_1, CH4_1_2_1, CH4_1_3_1, FC_1_1_1, FC_1_2_1, FC_1_3_1
SCH4_1_1_1, H, H_1_1_1, H_1_2_1, H_1_3_1, LE, LE_1_1_1, LE_1_2
SLE_1_2_1, SLE_1_3_1, WD_1_1_1, WD_1_2_1, WD_1_3_1, WD_F_1_
USTAR_1_1_1, USTAR_1_2_1, USTAR_1_3_1, USTAR_F_1_3_1, PA_1_
VPD_F_1_3_1, SWC_1_1_1, PPPD_IN_1_1_1, P, NEE, NEE_F, NEE_1

Processing code version: 0.4.19

Processing log file: http://ameriflux-data.lbl.gov/QAQCLogs/QAQC_repo

QA/QC Report: Format

This report details results of the AmeriFlux QA/QC data processing pipeline.

For more information, see How to Read This Report, QA/QC Results Definitions, FAQ, and Ur.

more information, see from to read find report, device or results belintations, free, and

Review all warningsIf autocorrected file is OK, no action is needed by the site team. If correct

Autocorrected File Report US-MOz_HH_200501010000_200601010000.csv

Site ID: US-MOz Site contact: Jeffrey Wood

Uploader: AMP Data Team (original file uploaded by Format QAQC Pipeline)

Upload date: 2018-Aug-15 17:27

Uploaded filename: US-MOz HH 200501010000 200601010000-20180815172726

Format QA/QC report summary:

All format QA/QC tests attempted. Issues were encountered. AMP attempted to auton warnings below. If autocorrected file is OK, no action is needed by the site team. If co

Test	Results	Additional Info
AMP made these autocorrections.	OWARNING	Filename col time)
Any Variables suspected gap-fill?	O WARNING	These variables no missing valu
Any Variables with ALL Data Missing?	@ WARNING	These variables H_1_1_1. Previ be overwritten.

Variable names found in the file:

TIMESTAMP_START, TIMESTAMP_END, P_1_1_1, PPFD_IN_1_1_1, PPFD_OUT_1
LW_IN_1_1_1, LW_OUT_1_1_1, NETRAD_1_1_1, TA_1_1_1, RH_1_1_1, CO2_1_1
USTAR_1_1_1, TS_1_1_1, SWC_1_1_1, G_1_1_1, PA_1_1_1, FC_1_1_1, SC_1_1
NEE. NEE F

Processing code version: 0.4.23

Processing log file: http://ameriflux-data.lbl.gov/QAQCLogs/QAQC_report_US-MOz

Uploaded File Report US-MOz_HH_20050101000000_20060101000000.csv

△ Consider revising your file preparation for future submissions by opening and reviewing t

QA/QC Report: Format

This report details results of the AmeriFlux QA/QC data processing pipeline.

For more information, see How to Read This Report, QA/QC Results Definitions, FAQ, and Upload Format Instructions

AIL	Review failures and war Upload a corrected replacemen		
Uploa	ded File Report Tonzi-und	erstory-2016.dat	Report ID: 8052
Site	ID: US-Ton contact: Dennis Baldocchi pader: Siyan Ma		
Uple	058.dat		
	mat QA/QC report summary: ormat QA/QC tests attempted. Is	sues were encountered.	Please correct issues and upload a replacement file.
Tes	st	Results	Additional Information
Are	Timestamp variables present?	▲ FAIL	Expected timestamp variable(s) TIMESTAMP_START, TIMESTAMP_END is / are missing.
Tim	nestamp problem encountered.	▲ FAIL	Filename Matches File Contents, Timestamp Column Resolution, Timestamp Row Resolution, Timestamp Duplicates
Issu	ues that cannot be autocorrected	. 🛕 FAIL	Unable to repair timestamps. AutoRepair FAILED.
Is F	filename Format valid?	▲ FAIL	These filename components are not in the standard AmeriFlux format: extension is not csv
Are	Timestamp variables as expecte	ed? A FAIL	These unexpected variables were found in columns 1 & 2 instead of TIMESTAMP_START and TIMESTAMP_END: yr, day
Is F	ilename Format valid?	WARNING	These filename components are not in the standard AmeriFlux format: incorrect number of components (expect timestamp errors)
	Data Variable names in correct nat?	⊗ WARNING	These variable names are not in standard AmeriFlux format: yr, day, endhour, endmin, DOY, FC_WPL_2D, fc_flag, WC_2D, CO2_LI7500, RHOC, CO2_var, CO2_skewness, CO2_kurtosis, RHOQ, q_var, q_skewness, q, kurtosis, Tsonic, Tsonic_var, Tsonic_skewness, Tsonic, kurtosis, Wind_Direction, Wind_Velocity, Friction_Velocity, stdw, wbar, w_var, w_kurtosis, u2D_var, v2D_var, Tair, absolute_humidity,

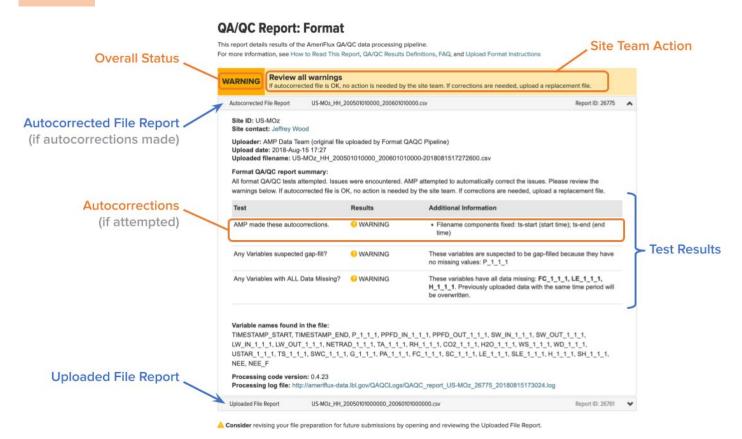
Vapor_pressure_deficit, Relhumidity, Pressure, TSOIL2,

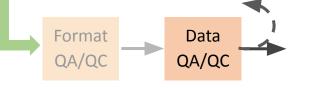
TSOIL4, TSOIL8, TSOIL16, TSOIL32, soil_moisture_00cm, soil_moisture_20cm, soil_moisture_50cm, precipitation. They will not be included in the standard AmeriFlux data products.

Format QA/QC Report

New online QA/QC Documentation available

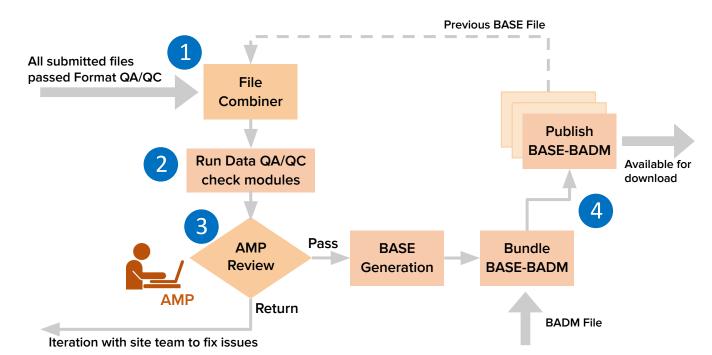
https://ameriflux.lbl.gov/data/data-processing-pipelines/format-gagc/

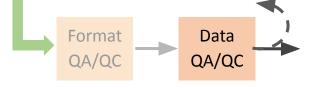




Data QA/QC and Report Email

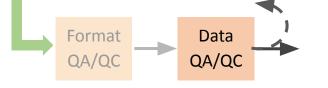
- Most recently uploaded data that pass Format QA/QC
- Performed on entire data record (recent uploaded + previous BASE)
- No data filtering/correction done by AMP





Data QA/QC Modules

- Secondary independent check
 - Adapted from Pastorello et al., 2014, IEEE, DOI: 10.1109/eScience.2014.45
 - Lesson-learned from flux networks
 - Feedback from data users and ONEFlux processing
 - Post hoc approach (w/ limited ancillary info & diagnostics)
 - Trade-off between site-specific & universal
 - Emphasize visualization (for issue identification & communication)
- Adopted in FLUXNET2015 & all BASE published since 2017



Data QA/QC Modules

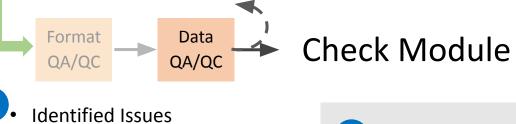
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- Adopted in FLUXNET2015 & all BASE published since 2017

Implemented Modules

- Timestamp alignment
- Physical range
- Diurnal & Seasonal pattern
- Multivariate comparison
- USTAR filtering

Planned Modules

- Variable availability
- Sign convention check
- SIGMA family
- Variability check
- Unit check (ratio-percentage, metric conversion)



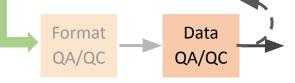


Supporting Summary Statistics

1

2

Additional Figure Figure

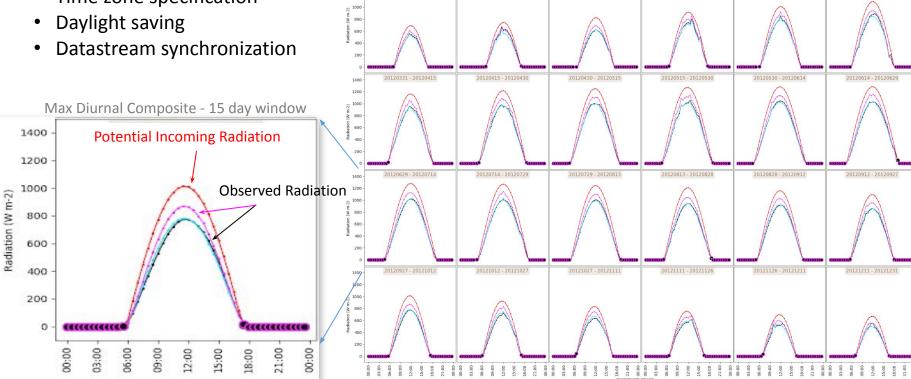


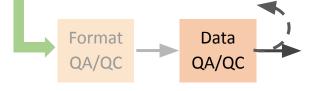
Timestamp Alignment Check

SW_1_1_1 has max cross-correlation 0.997 at lag 0 (0% exceed SW_IN_POT)

PPFD_IN_1_1_1 has max cross-correlation 0.998 at lag 0 (0% exceed SW_IN_POT)

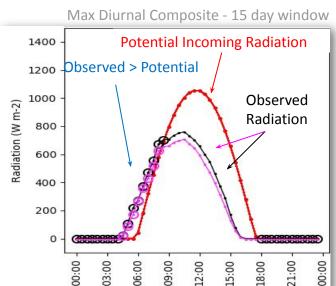
- Misspecified timestamps
- Time zone specification



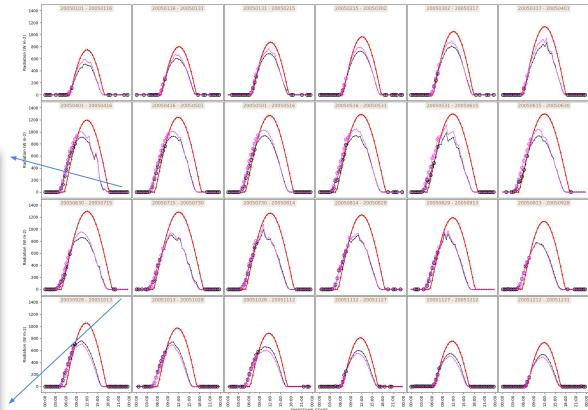


Timestamp Alignment Check

- Consistent shift
 - Timestamp End or Start
 - Time zone specification
- Inconsistent shift
 - Daylight saving
 - Clock resetting





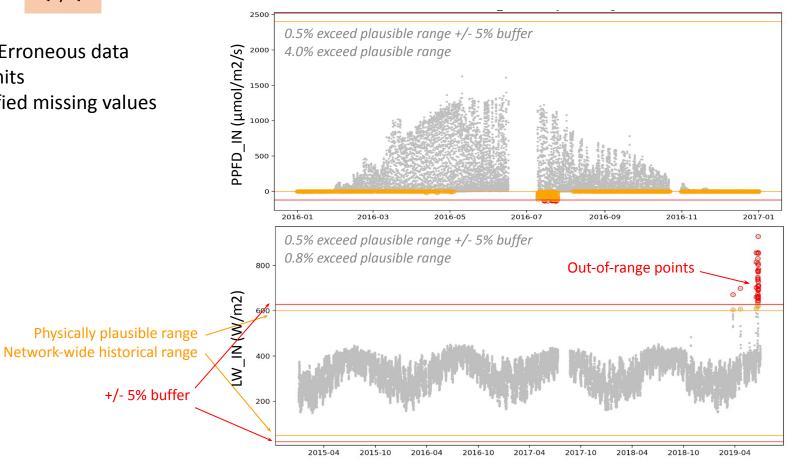


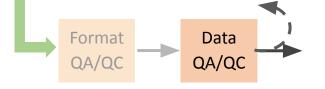


Physical Range

- Outlier / Erroneous data
- Wrong units
- Misspecified missing values

+/- 5% buffer

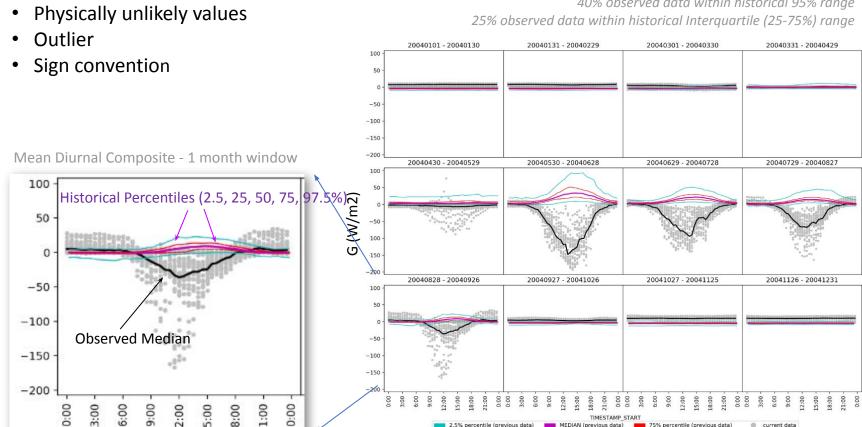




Diurnal-Seasonal Pattern

40% observed data within historical 95% range

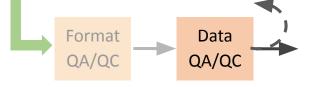
97.5% percentile (previous data)



25% percentile (previous data)

21:00

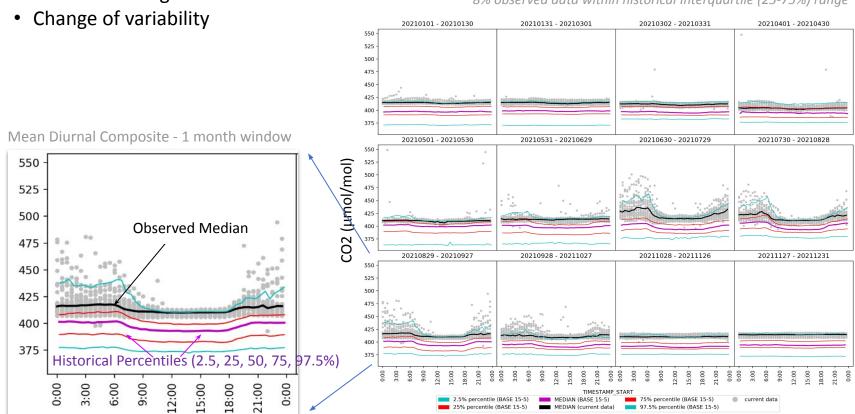
18:00

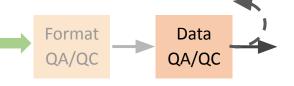


Diurnal-Seasonal Pattern

Shifted full range

78% observed data within historical 95% range 8% observed data within historical Interquartile (25-75%) range





Multivariate Comparison

SW_IN vs PPFD_IN

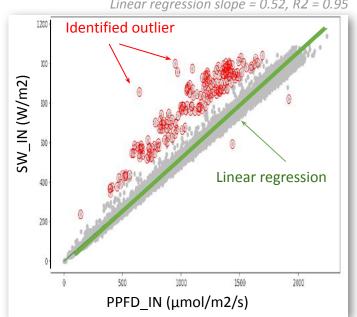
USTAR vs WS

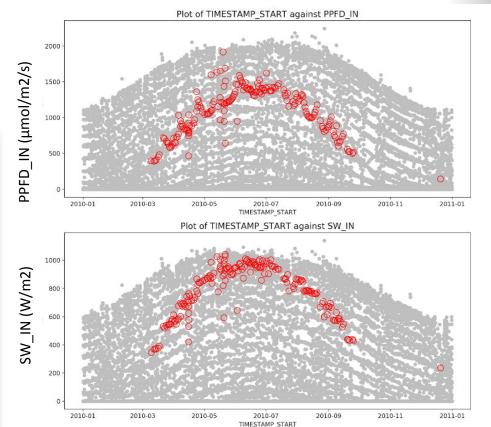
TA vs T_SONIC

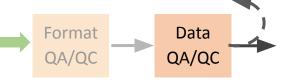
TA profile

- Short-term Inconsistency
 - Sensor malfunction
 - Shaded radiation
 - Contamination

2% deviated from linear relationship Linear regression slope = 0.52, R2 = 0.95







Multivariate Comparison

SW_IN vs PPFD_IN

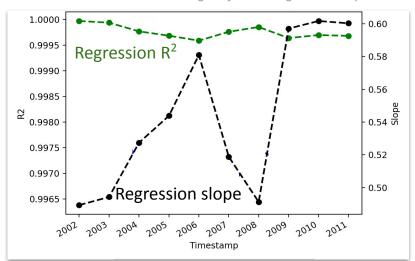
USTAR vs WS

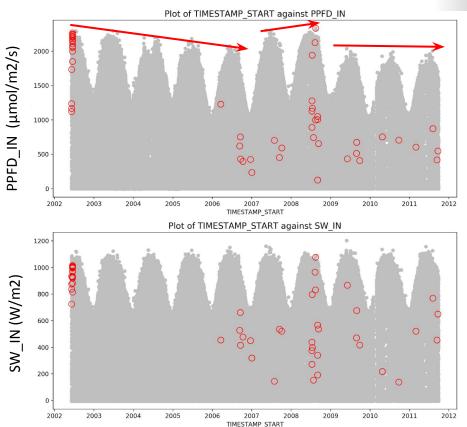
TA vs T_SONIC

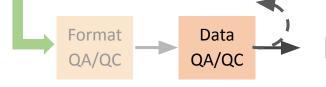
TA profile

- Long-term trend or step change
 - Sensor Degradation
 - Replacement of sensor
 - Change of measurement location



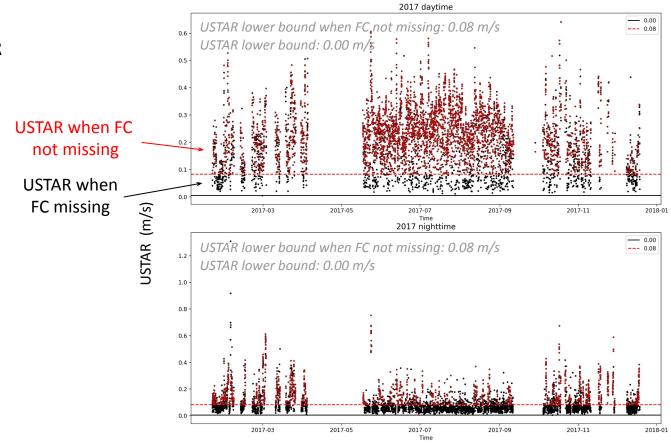


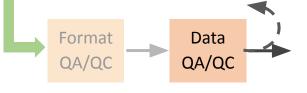




FC-USTAR Filtering

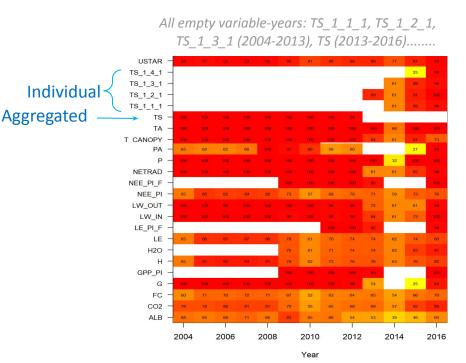
- Filtered USTAR
- Filtered FC by USTAR



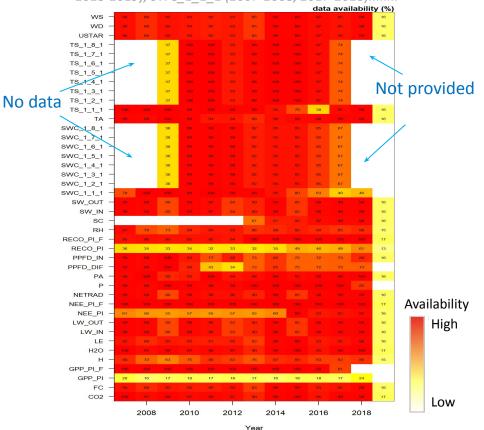


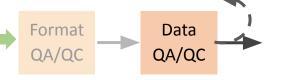
Variable Availability

- Long gaps
- Missing mandatory variables
- Inconsistent variable naming / qualifier



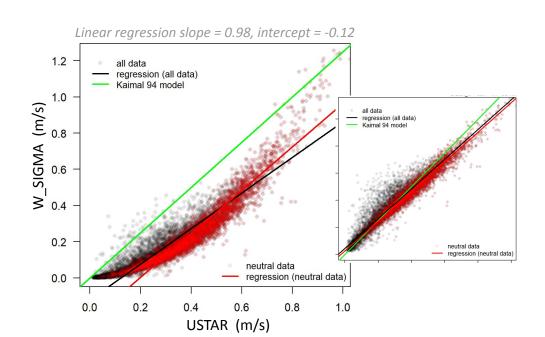
All empty variable-years: TS_1_1_1 (2007-2008, 2018-2019), SWC_1_1_1 (2007-2008, 2017-2018).......

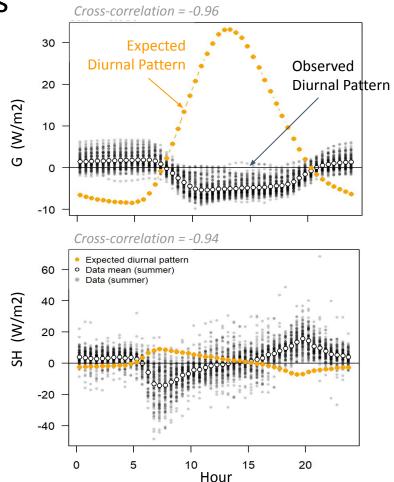


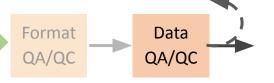


Planned Checks

- SIGMA family (standard deviation)
- Sign convention check
- Variability check (excessive, dampened)
- Unit check (ratio-percentage, metric conversion)



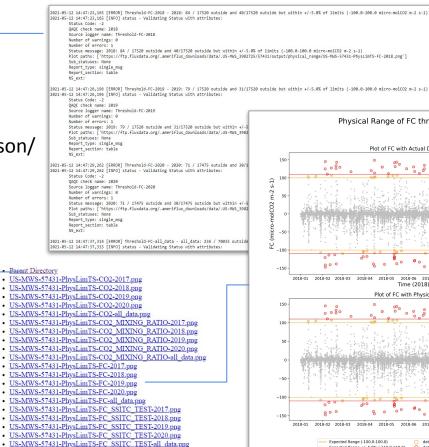


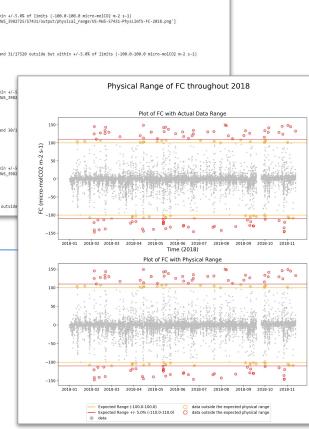


Data QA/QC Output

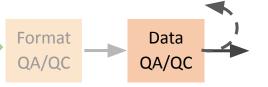
US-MWS-57431-PhysLimTS-FETCH 70-2017.png

- Public FTP
 - logs/
 - output figures/
 - diurnal seasonal/
 - multivariate_intercomparison/
 - physical range/
 - timeshift/
 - ustar filter test/
 - Intermediate files/

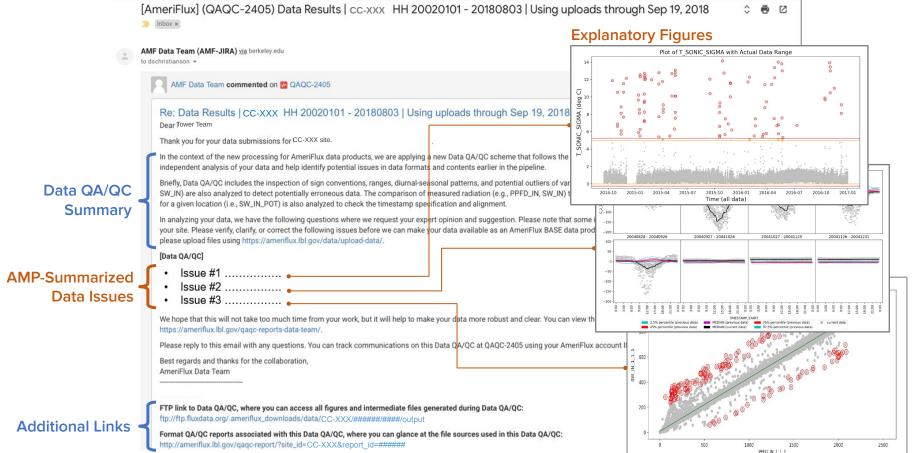


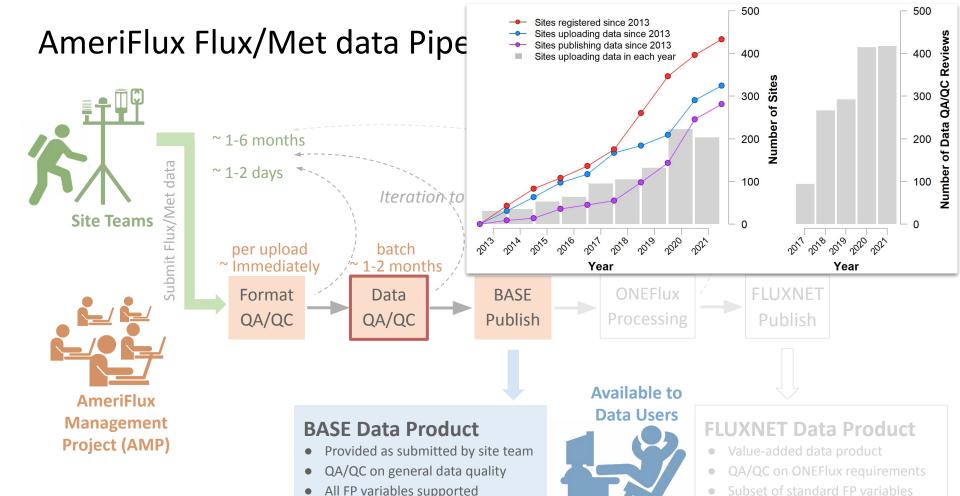






Data QA/QC and Report Email





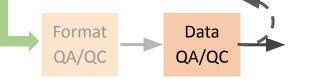
All levels of aggregation supported





Consideration

- Keep up with growth of networks & submissions
- Develop while maintaining data service
- Enable self-review & quick assessment
- Gain users' feedback on automatic QA/QC
- Refine check modules & rules for passing/warning
- Scalable workflow for adding new check modules



Data QA/QC Next Stage

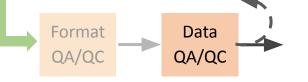
- Consideration
 - Keep up with growth of networks & submissions
 - Develop while maintaining data service
 - Enable self-review & quick assessment
 - Gain users' feedback on automatic QA/QC
 - Refine check modules & rules for passing/warning
 - Scalable workflow for adding new check modules

Phase II: Automatic data QA/QC report

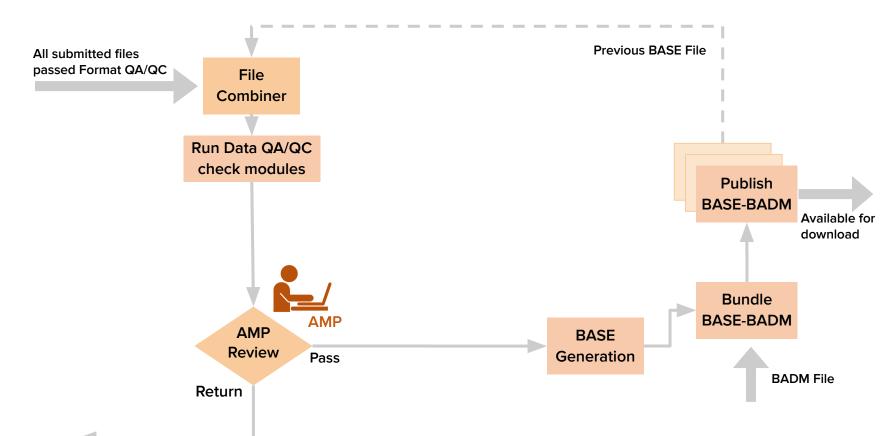
- Most returning sites
- Self-explanatory QA/QC report
- Develop and implement new check modules

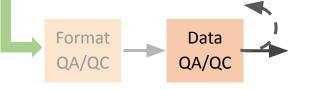
Phase I: Enable self-review for trained users Core, NEON, volunteer returning sites (limited capacity)

Training + Summary statistics + Linked figures Gain users' feedback designing Data QA/QC reports Re-evaluate and refine check modules Current state

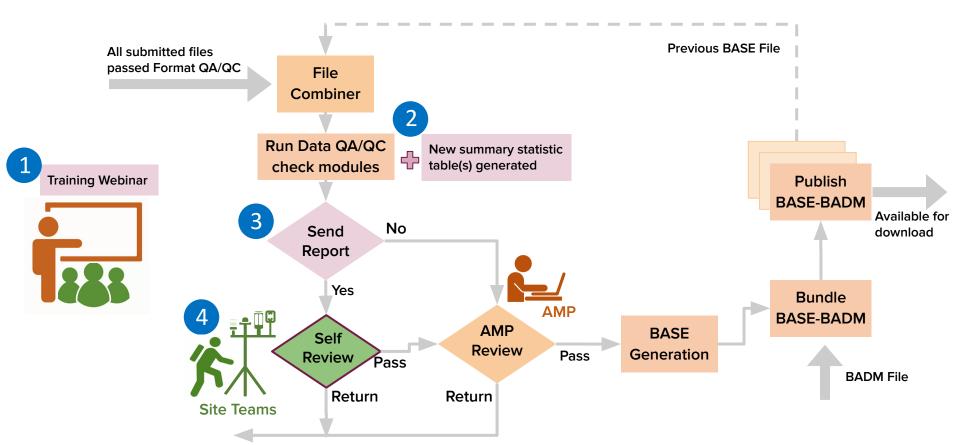


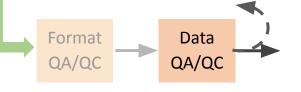
Data QA/QC Current State





Data QA/QC Next Stage (Phase I)





Data QA/QC Next Stage (Phase I)

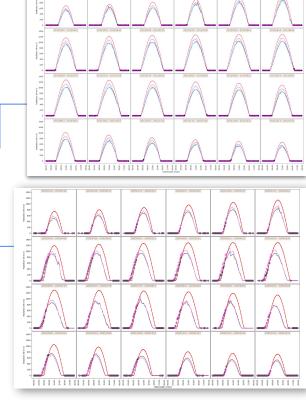
- Public FTP
 - logs/
 - output figures/
 - Intermediate files/
- Summary statistics/
 - Timestamp alignment/
 - 0

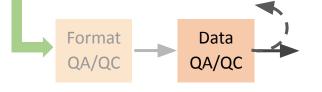
Year	$max(abs(R_{xy}))$	t _{max}	P _{day} (%)	P _{night} (%)	Figure link
2016	0.98	0	5	5	<url> —</url>
2017	0.97	0	1	2	<url></url>
2018	0.99	0	0	1	<url></url>
2019	0.95	2	10	10	<url> -</url>

- ullet max(abs(R_{xy})) : maximum absolute cross correlation (R_{xy}) between the time series X and Y.
- t_{max}: the timestep shift at which the max(abs(R_{xy})) is found. t_{max} equating zero indicates that time series X and Y are aligned.
- P_{day}: percentage of occasions that measured radiation exceed potential incoming radiation in daytime.
- P_{night}: percentage of occasions that measured radiation exceed potential incoming radiation in nighttime.



US-NR1 timestamp shift radiation 2019.png
 US-NR1 timestamp shift radiation 2020.png
 US-NR1 timestamp shift radiation 2021.png



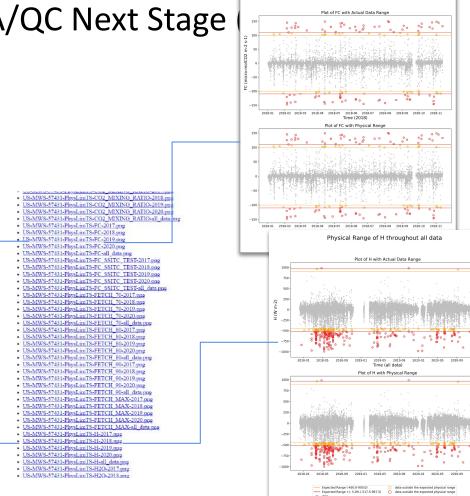


Data QA/QC Next Stage

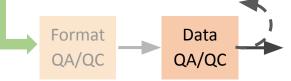
- Public FTP
 - logs/
 - output figures/
 - Intermediate files/
- Summary statistics/
 - Timestamp alignment/
 - Physical range/

	Variable	Year	P _{soft_flag} (%)	P _{hard_flag} (%)	Figure link
	FC	2018	2.5	1.5	<url></url>
	FC	2019	0.1	0	<url></url>
	LE	2018	0	0	<url></url>
	LE	2019	0	0	<url></url>
ĺ	Н	2018	8.9	5.6	<url></url>
ĺ	н	2019	0	0	<url></url>

- \bullet $\mathbf{P}_{\text{soft-flag}}$: percentage of data points outside the expected physical range, but within the buffer range (+/-5% of physical range)
- ullet $\mathbf{P}_{\mathbf{hard_flag}}$: percentage of data points outside the expected physical range plus the buffer range



Physical Range of FC throughout 2018



Data QA/QC Next Stage (Phase I)

> Inbox x AMF Data Team (AMF-JIRA) via berkeley.edu Thu, Sep 20, 12:37 PM to dschristianson -AMF Data Team commented on Ma QAQC-2405 Re: Data Results | CC-XXX HH 20020101 - 20180803 | Using uploads through Sep 19, 2018 Dear Tower Team Thank you for your data submissions for CC-XXX site. In the context of the new processing for AmeriFlux data products, we are applying a new Data QA/QC scheme that follows the Format QA/QC. We believe that these checks can provide an independent analysis of your data and help identify potential issues in data formats and contents earlier in the pipeline. Briefly, Data QA/QC includes the inspection of sign conventions, ranges, diurnal-seasonal patterns, and potential outliers of variables. Multivariate relations (e.g., WS vs USTAR, PPFD_IN vs Data QA/QC SW_IN) are also analyzed to detect potentially erroneous data. The comparison of measured radiation (e.g., PPFD_IN, SW_IN) to the maximum, top of the atmosphere radiation expected for a given location (i.e., SW_IN_POT) is also analyzed to check the timestamp specification and alignment. Summary In analyzing your data, we have the following questions where we request your expert opinion and suggestion. Please note that some issues we identify could be normal and expected at your site. Please verify, clarify, or correct the following issues before we can make your data available as an AmeriFlux BASE data product. If you decide to resubmit a corrected version, please upload files using https://ameriflux.lbl.gov/data/upload-data/. [Data QA/QC] Link to Summary Statistics (Timestamp alignment) Links to Summary • Link to Summary Statistics (Physical range) • Link to Summary Statistics (Multivariate comparison) **Statistics Tables** We hope that this will not take too much time from your work, but it will help to make your data more robust and clear. You can view the status of all of your uploaded files at https://ameriflux.lbl.gov/qaqc-reports-data-team/. Please reply to this email with any questions. You can track communications on this Data QA/QC at QAQC-2405 using your AmeriFlux account ID and password to login. Best regards and thanks for the collaboration, Links to AmeriFlux Data Team **Training Materials** Link to Training Materials (<URL>) FTP link to Data QA/QC, where you can access all figures and intermediate files generated during Data QA/QC: ftp://ftp.fluxdata.org/.ameriflux_downloads/data/CC-XXX/######/###/output

Format QA/QC reports associated with this Data QA/QC, where you can glance at the file sources used in this Data QA/QC:

http://ameriflux.lbl.gov/gagc-report/?site_id=CC-XXX&report_id=######

Additional Links

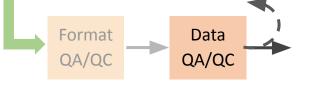
Data QA/QC Next Stage (Phase I)

Detailed Timeline 2022

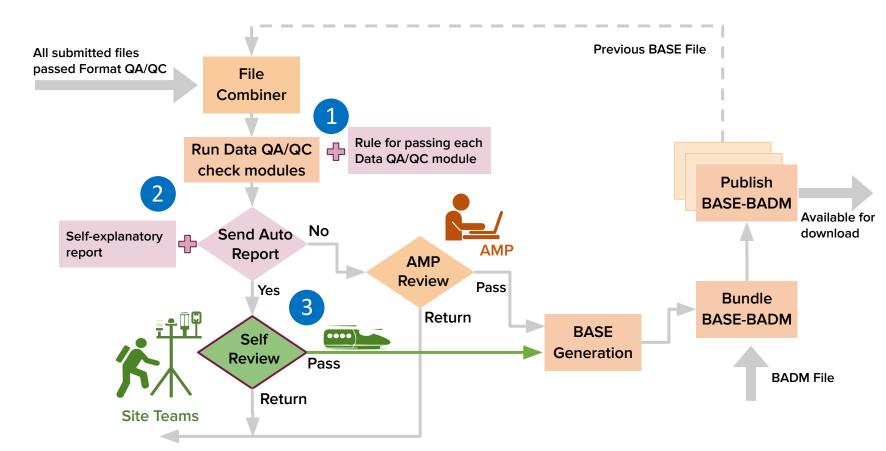
- Now March: Seek for participating sites (invitation sent later)
- June / July (TBD): Training webinar
- June September:
 - Submit data as planned & self-review using summary statistics (interim)
 - Participate in the individual user interview
- September (TBD): Re-evaluation webinar

What to expect?

- Participate in the training and re-evaluation webinars
- Submit data (new quarters/year) at least once & self-review using summary statistics
- Participate in the individual user interview (1-2 hour feedback session, 1-2 times)



Data QA/QC Future (Phase II, draft plan)



Questions / Feedback

- How do you think about the new self-review process?
- Would the summary statistics be manageable? Or anything else?
- Which part of the data pipeline or QA/QC can be improved?
- Would you be interested in participating in the self-review?
- Anything you'd like to see in future data pipeline?
-

Related links

- https://ameriflux.lbl.gov/data/data-processing-pipelines/
- https://ameriflux.lbl.gov/half-hourly-hourly-data-upload-format/
- https://ameriflux.lbl.gov/community/amp-webinar-series/









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